



**Barcelona  
Supercomputing  
Center**  
*Centro Nacional de Supercomputación*



# Dust assimilation activities at the Barcelona Supercomputing Center

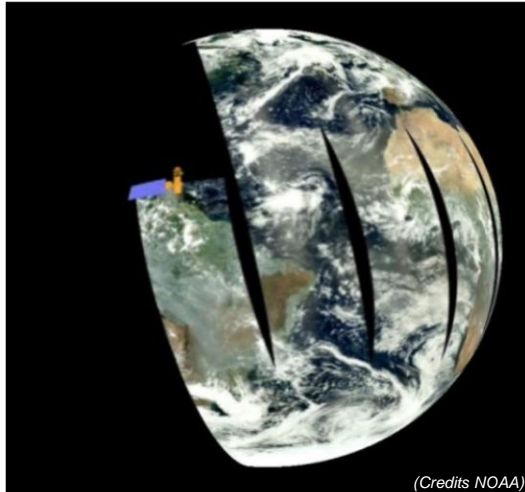
Enza Di Tomaso, Nick Schutgens, Paul Ginoux,  
Oriol Jorba, Carlos Pérez García-Pando

24/05/2018

9th International Workshop on Sand / Dust storms and  
Associated Dustfall, Tenerife, Spain

# Data assimilation

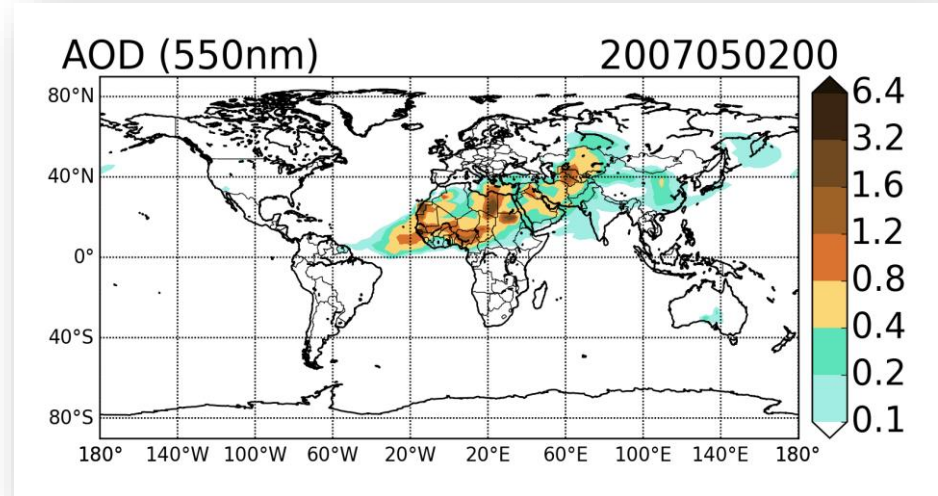
## Satellite observations



*MODIS swath on the NASA polar orbiting satellite Aqua*



## Model simulations

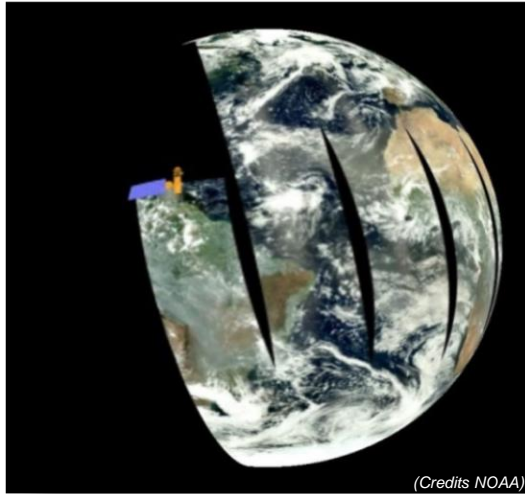


*Dust optical depth simulated by NMMB-MONARCH*

**Data assimilation combines model simulations and observations** to obtain the 'best' estimate of current atmospheric conditions (analysis)

# Data assimilation

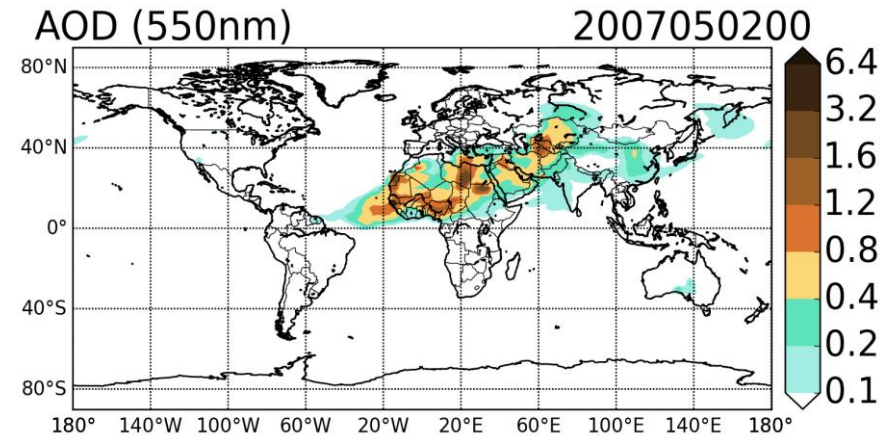
## Satellite observations



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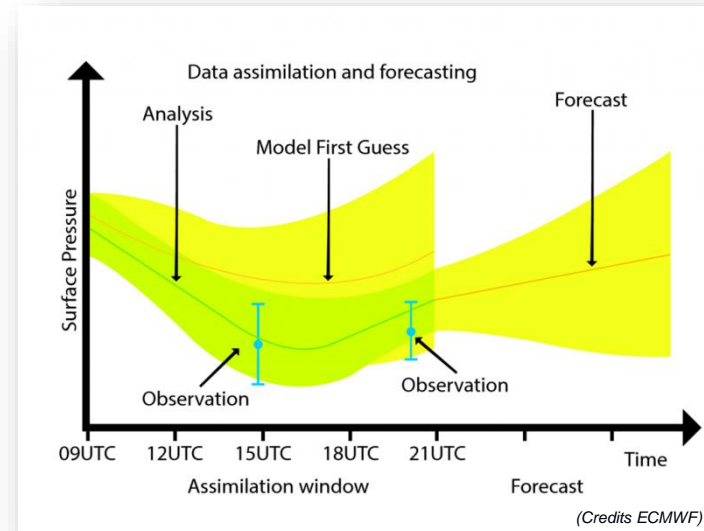


## Model simulations



*Dust optical depth simulated by NMMB-MONARCH*

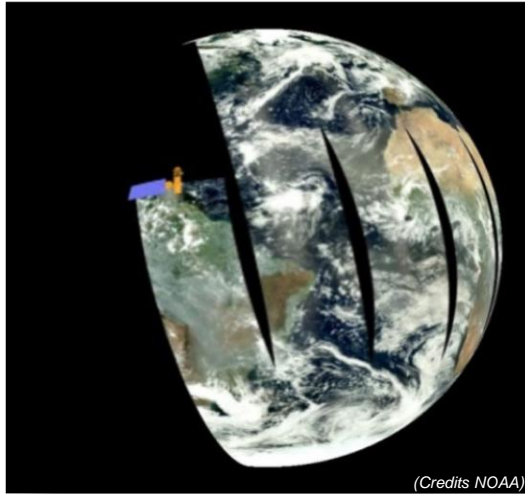
**Data assimilation combines model simulations and observations** to obtain the 'best' estimate of current atmospheric conditions (analysis)





# Data assimilation

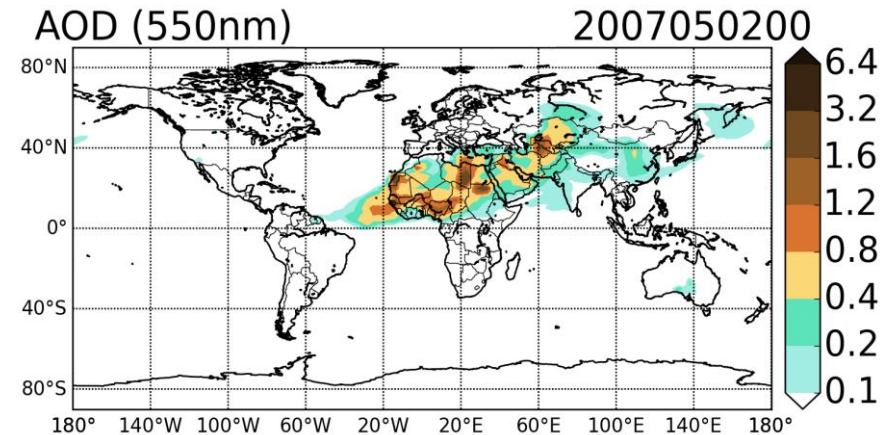
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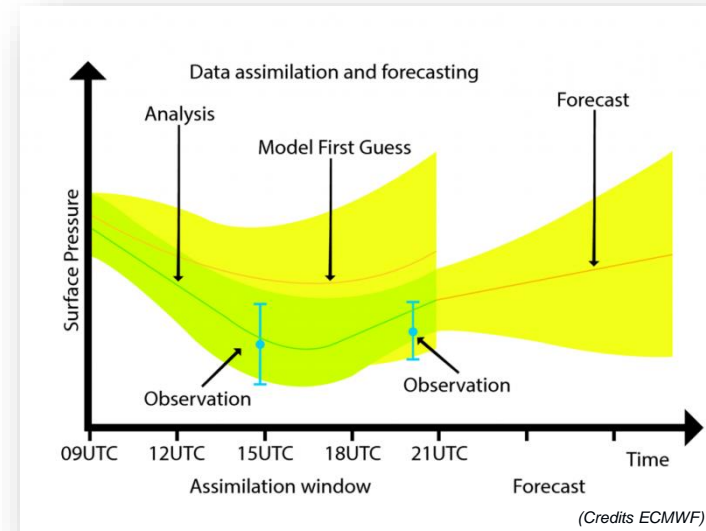


Dust optical depth simulated by NMMB-MONARCH

**Data assimilation combines model simulations and observations** to obtain the 'best' estimate of current atmospheric conditions (analysis)

-> *useful to initialise models and improve predictions*

→ *used to produce reanalysis*



# Motivation

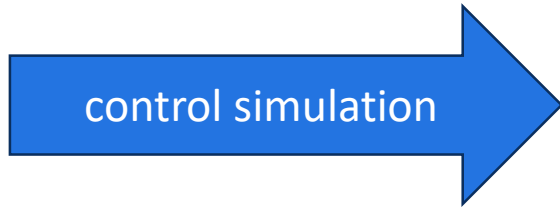
Operational **dust forecast** and **dust reanalyses** are produced in the framework of aerosol data assimilation, where **total AOD** is used to constrain all the main aerosol species

# Motivation

Operational **dust forecast** and **dust reanalyses** are produced in the framework of aerosol data assimilation, where **total AOD** is used to constrain all the main aerosol species

*Assess the potential benefit of dedicated dust observation products in dust data assimilation*

# Experiment design



Dust component of the NMMB-MONARCH chemical weather system (Pérez et al., 2011)

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# Experiment design



control simulation

Dust component of the NMMB-MONARCH chemical weather system (Pérez et al., 2011)

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ensemble forecast

NMMB-MONARCH ensemble members are obtained perturbing uncertain model.



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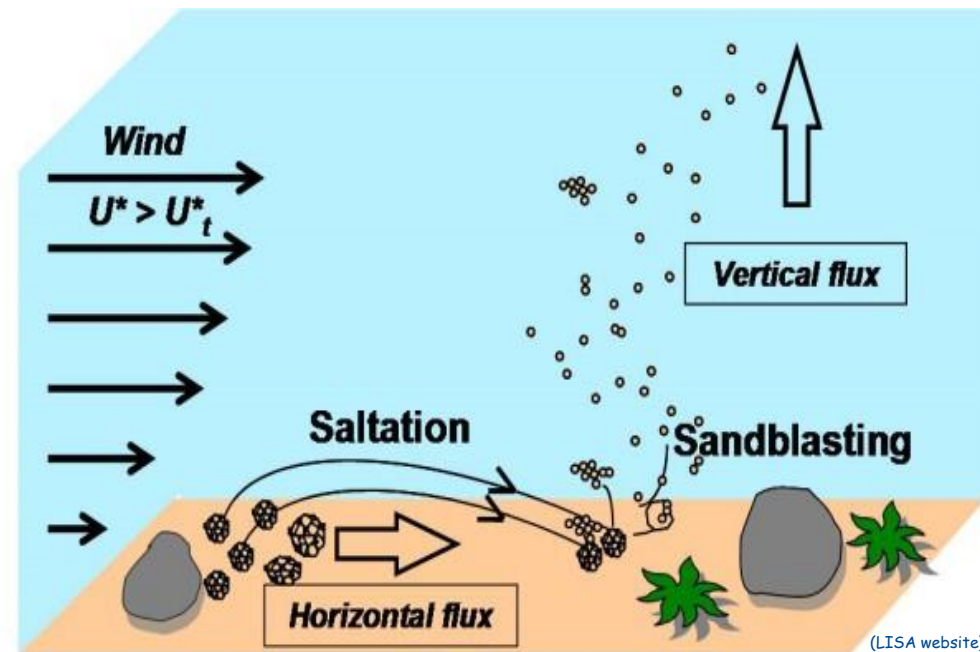
Role of B matrix:

- spatial spreading of information from observations
- statistically consistent increments between neighbouring grid points
- multivariate analysis

# Generation of ensemble forecast

The ensemble forecast has been designed considering model uncertainties with respect to:

- **surface winds,**
- **soil humidity,**
- **vertical flux distribution at sources,**



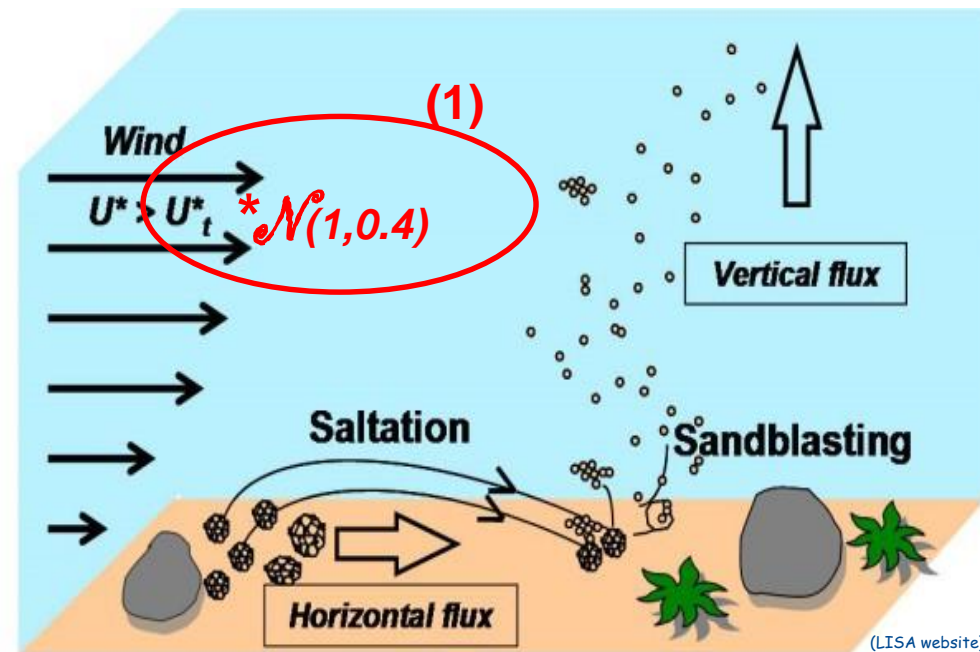
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by perturbing:

**(1) the threshold friction velocity**



(LISA website)

# Generation of ensemble forecast

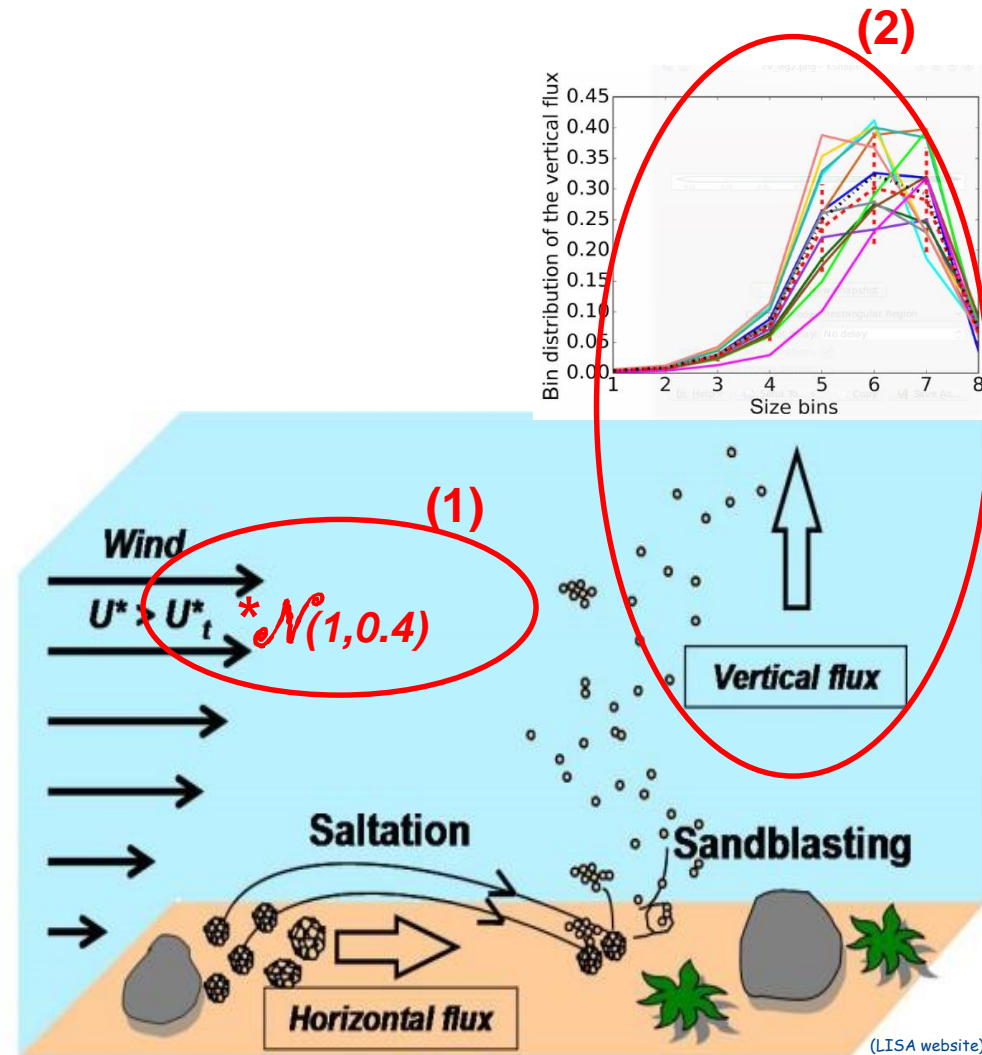
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- **surface winds,**
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- **vertical flux distribution at sources,**

by perturbing:

(1) the threshold friction velocity

(2) the vertical flux of dust in each of the eight dust transport bins



# Experiment design



data assimilation

- An ensemble-based DA scheme: LETKF
- usage of a flow-dependent background error covariance
  - performing the analysis locally
-

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data assimilation

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observations

Dedicated dust observations:

- MODIS Dark Target and Deep Blue AOD in dust-dominated conditions
- MODIS Deep Blue coarse AOD
- IASI dust AOD

# MODIS Dark Target and Deep Blue, Level3



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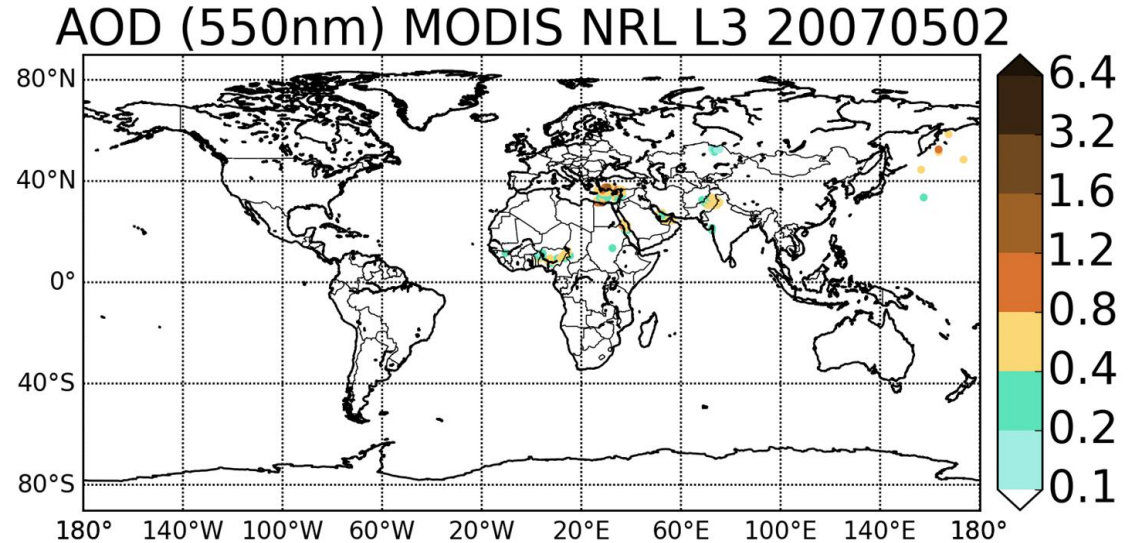
# Assimilated observations

## NRL MODIS Dark Target, L3 C5

- filtered and corrected,
- spatially aggregated,
- uncertainty estimation

(*Zhang and Reid, 2006; Hyer et al., 2010; Shi et al., 2011*)

- AE, AI filter for dust

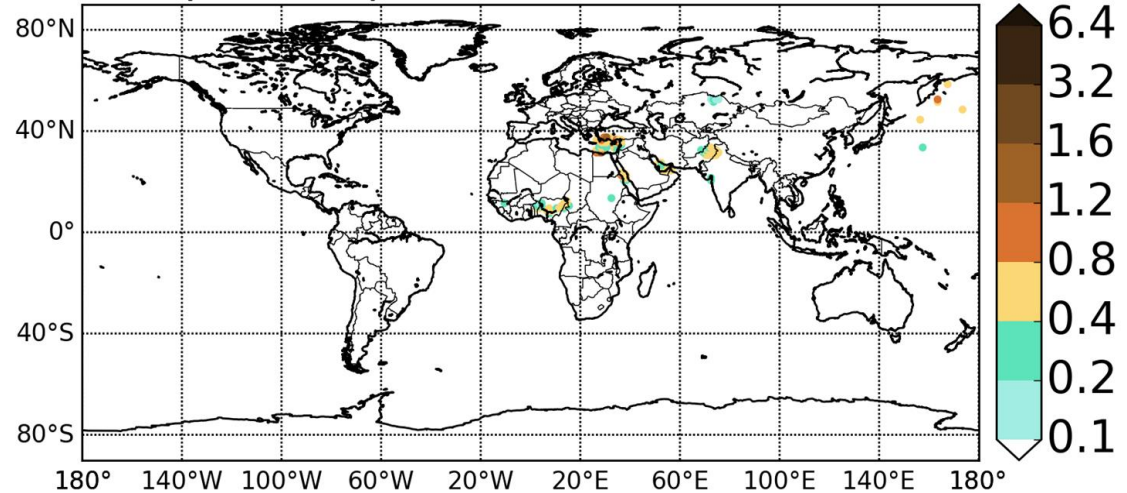


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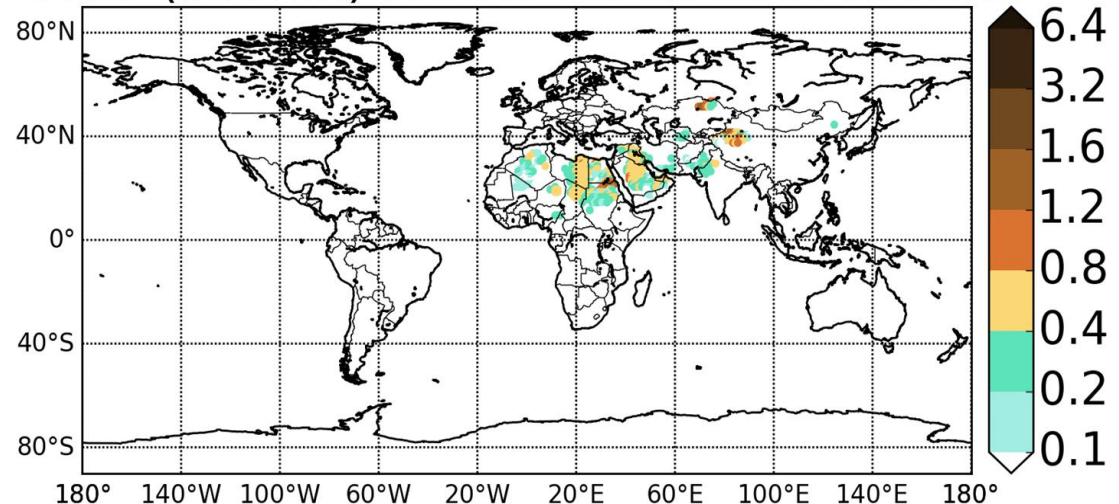
AOD (550nm) MODIS NRL L3 20070502



## MODIS Deep Blue, L3 C6

- aggregation of highest quality L2
- uncertainty model for L2  
(*Sayer et al., 2014*)
- AE, AI, counts filter
- uncertainty model for L3:  
 $\sigma_m^2 + \sigma_r^2$

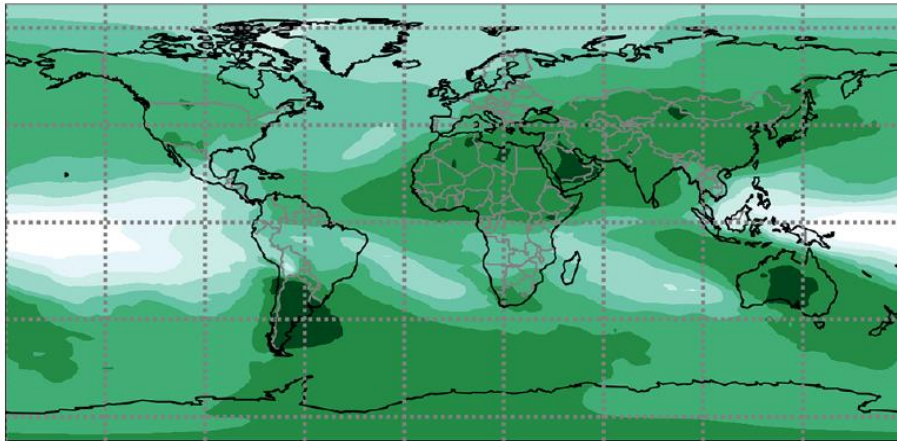
AOD (550nm) MODIS DB L3 2007050212



# Ensemble Spread Reduction

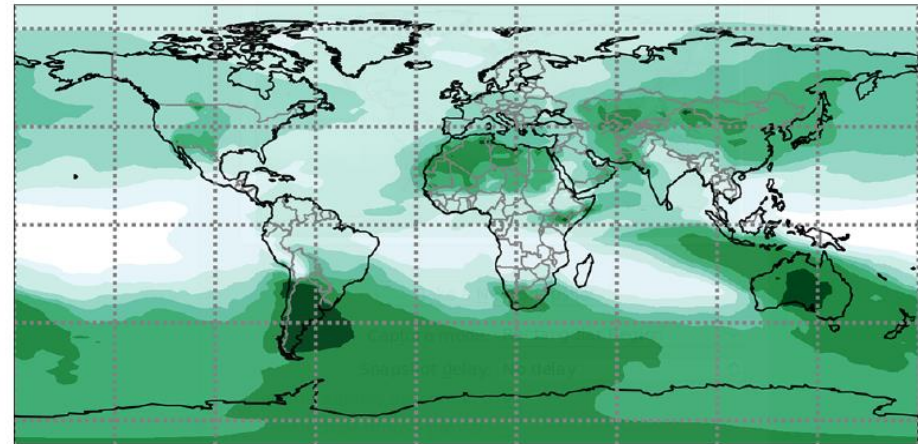
Ensemble free run

Dust AOD (550 nm) CV, ENS-free-run



Data assimilation run

Dust AOD (550 nm) CV, DA-NRL-DB

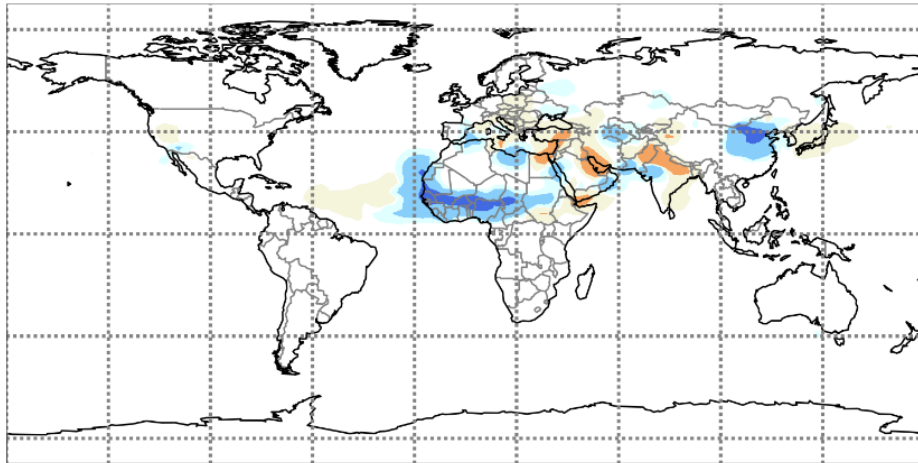


Data assimilation lowers the values of the coefficient of variation in the regions where observations are present, which indicates a reduction of the ensemble spread due to the assimilated observations

# Analysis increments

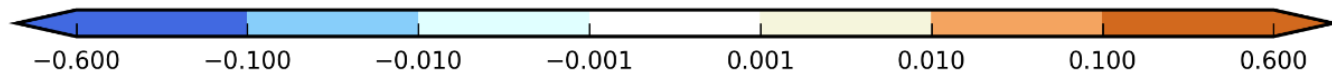
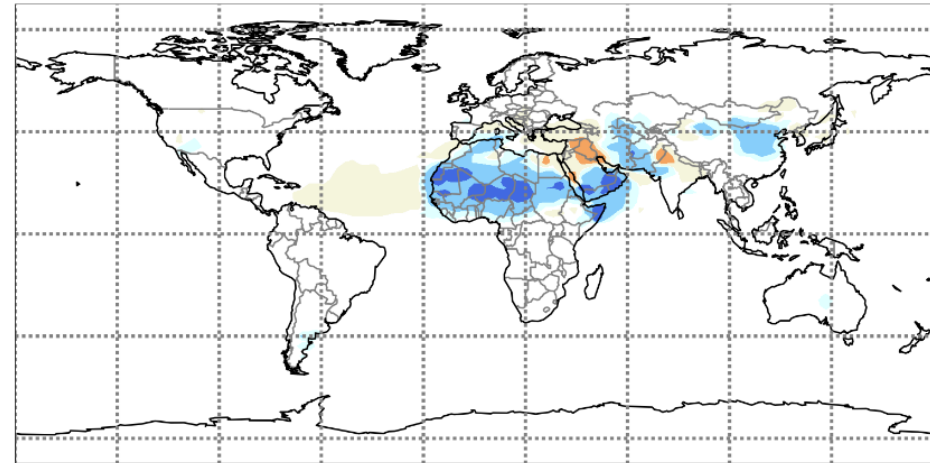
## MODIS NRL

Dust AOD (550nm) AN - FG, DA-NRL



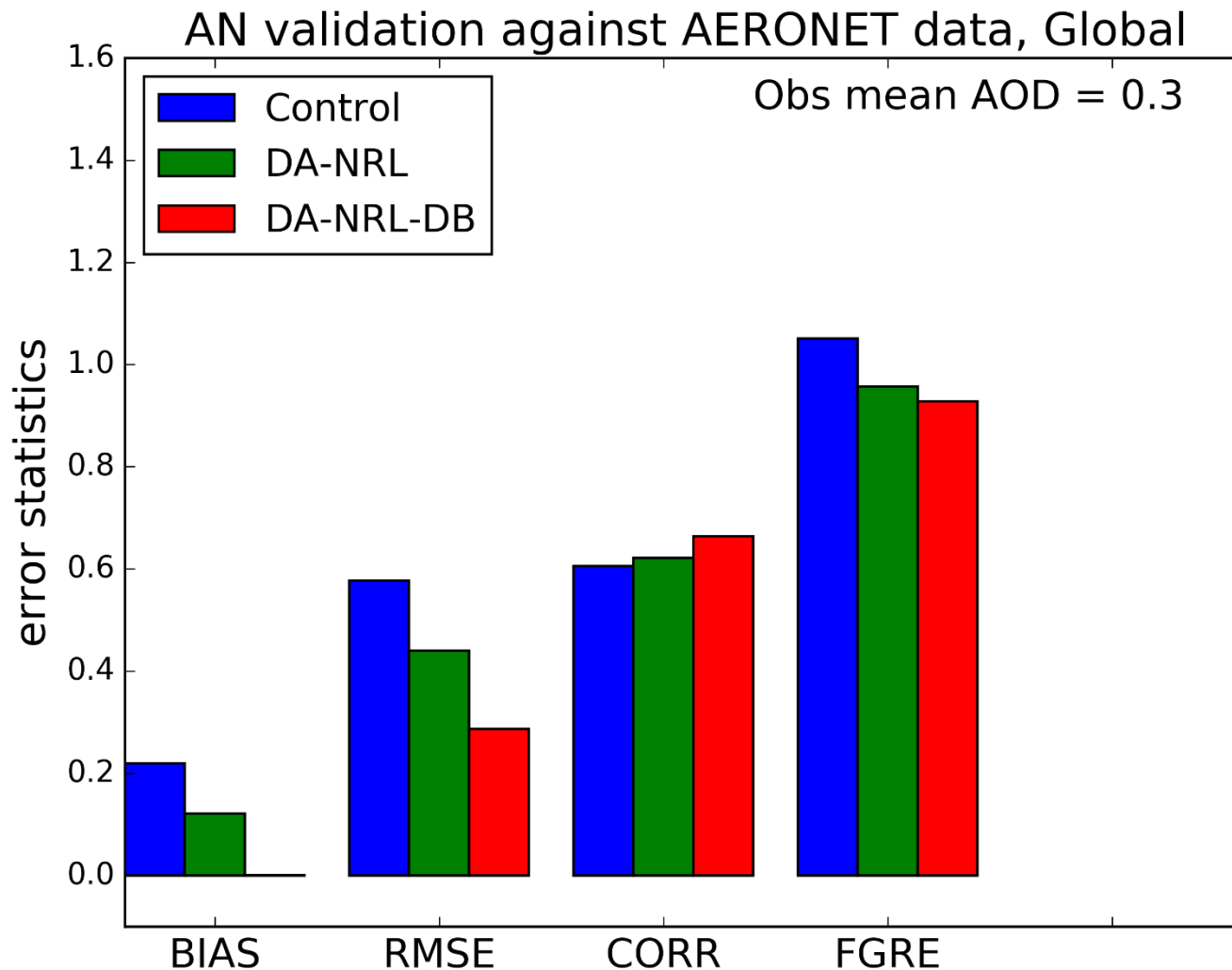
## MODIS NRL +DB

Dust AOD (550nm), AN - FG, DA-NRL-DB



- Non-zero systematic increments are to be interpreted as systematic corrections that these sets of observations are making, in particular removing mass close to sources and, to a lesser extent, adding mass in the outflow.
- The spatial distribution of the increments highlights the role that MODIS Deep Blue observations play in particular over the Sahara dust sources

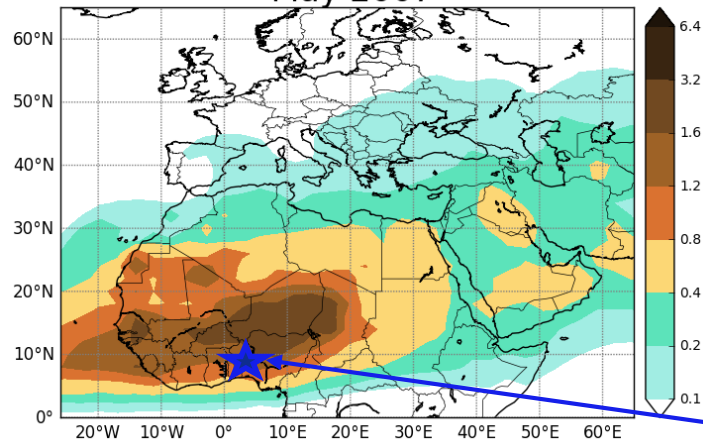
# Validation of the analysis



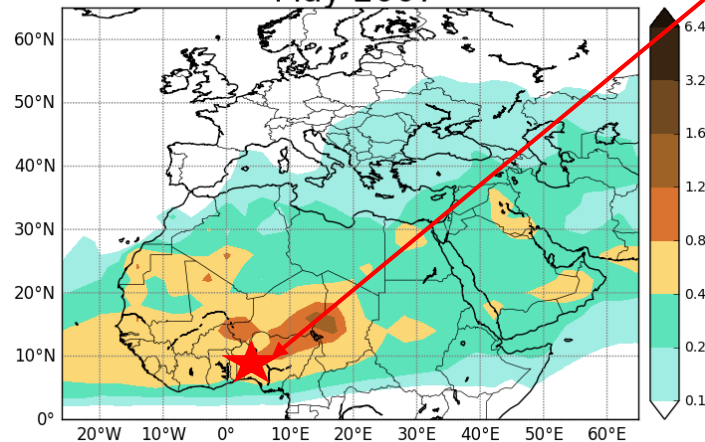


# Validation of the forecast

Dust AOD (550nm), Control Simulation  
May 2007

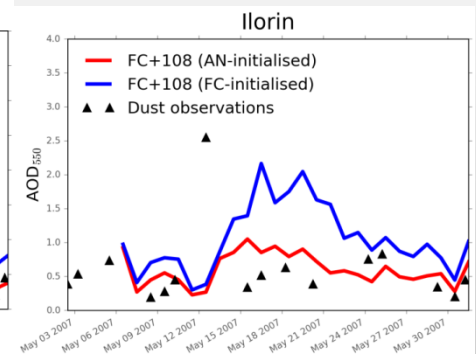
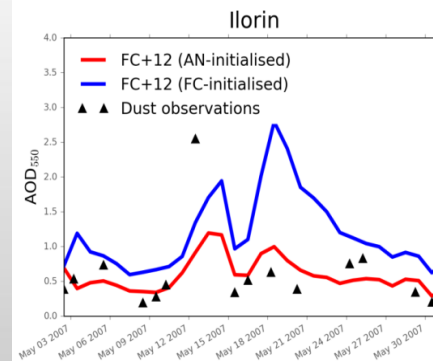
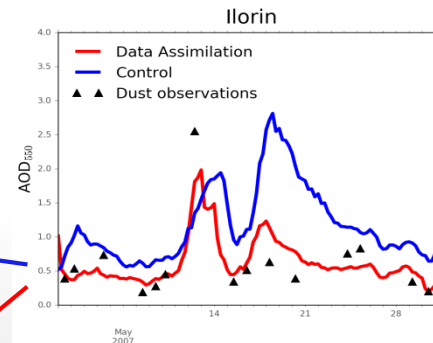


Dust AOD (550nm), DA Simulation  
May 2007



## Validation

Better description of  
current and forecast  
conditions for dust  
with data assimilation



*AERONET site of independent sun photometer observations*

# MODIS Deep Blue, Level 2



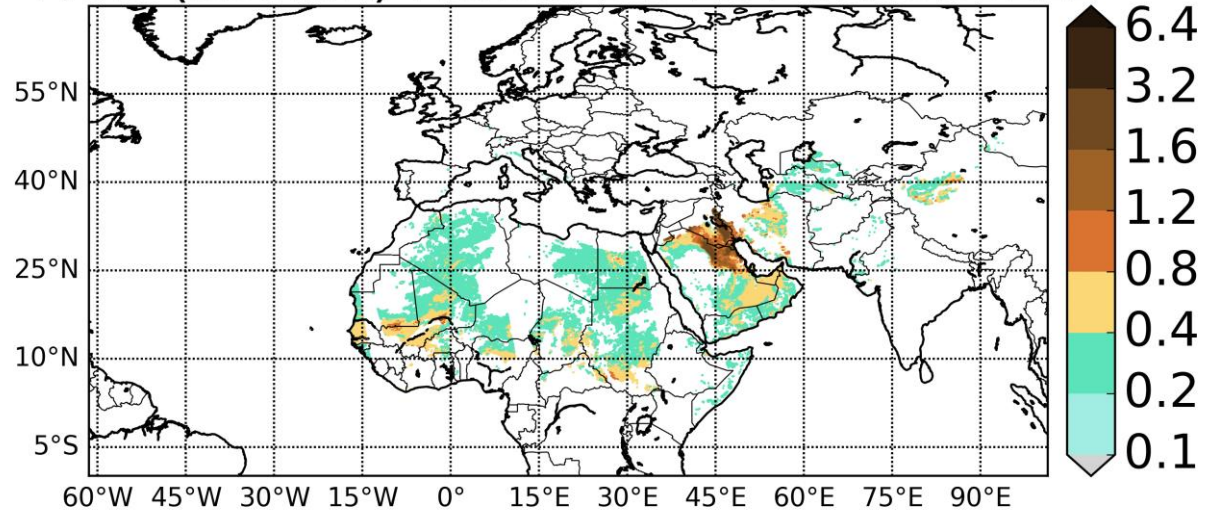
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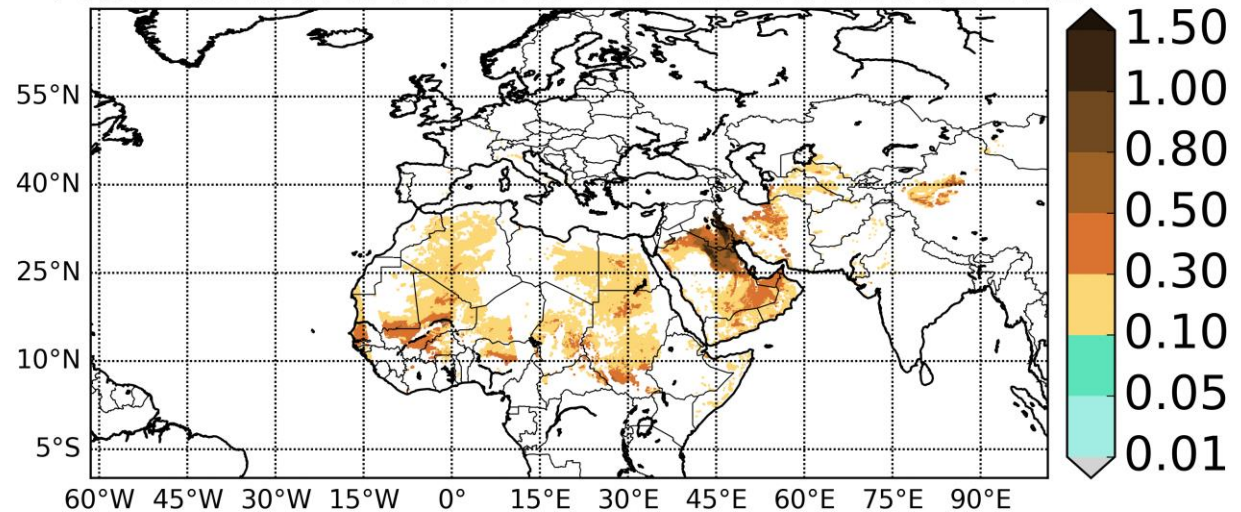
# Assimilated observations

AOD (550nm) MODIS DB \_\_ 2012030112



**MODIS Deep Blue, L2 C6**  
- AE,  $\omega$  filter, coarse AOD  
- highest quality flag  
(Ginoux et al., 2012, Pu & Ginoux, 2017)  
- uncertainty model based on Sayer et al., 2014

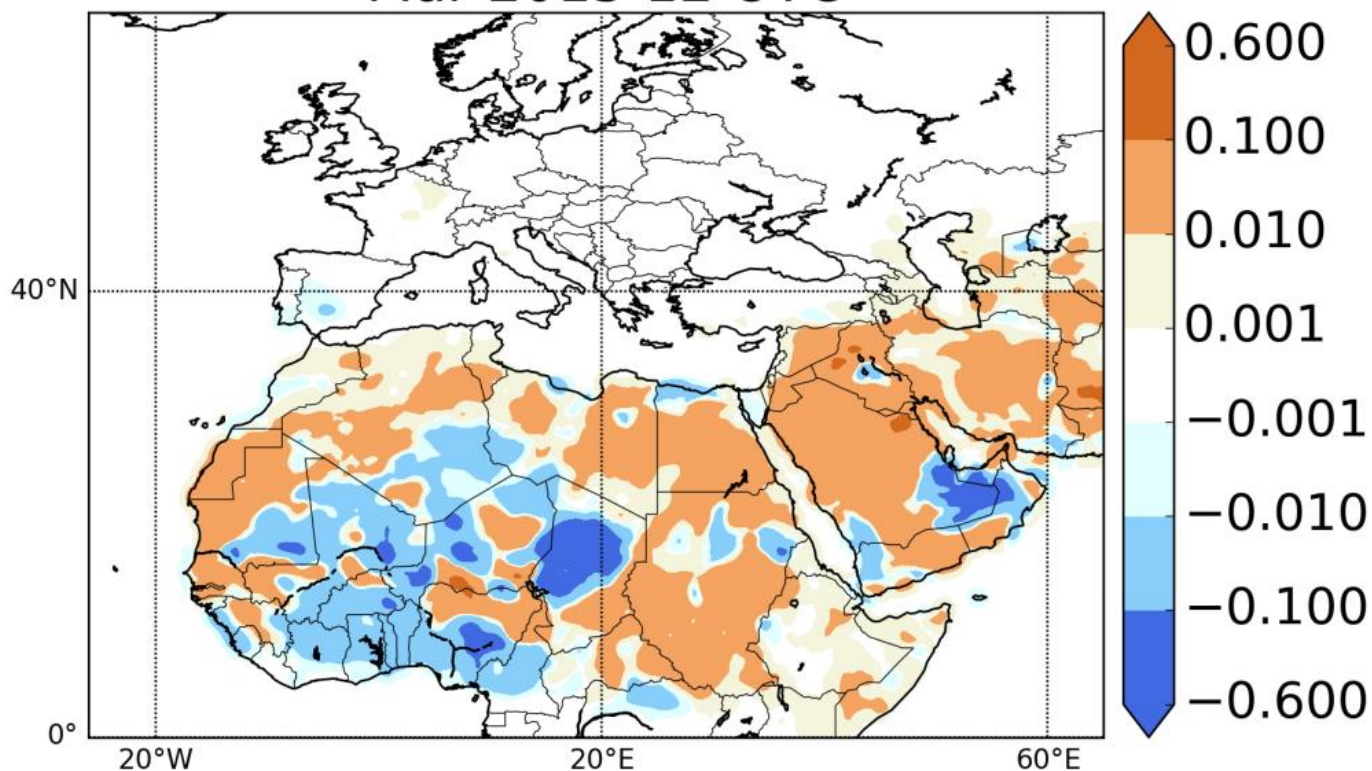
AOD Uncert. MODIS DB \_\_ 2012030112



# Analysis increments

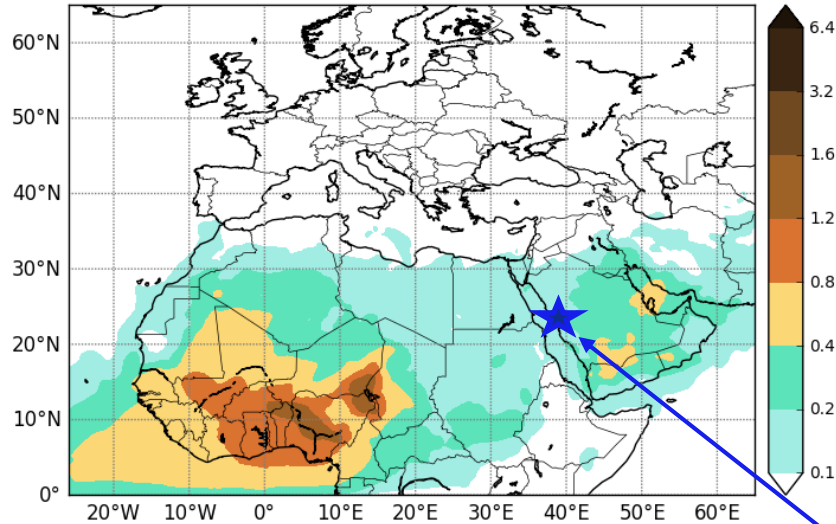
*Feedback from assimilation increments*

Dust AOD (550nm) analysis - first guess  
Mar 2015 12 UTC

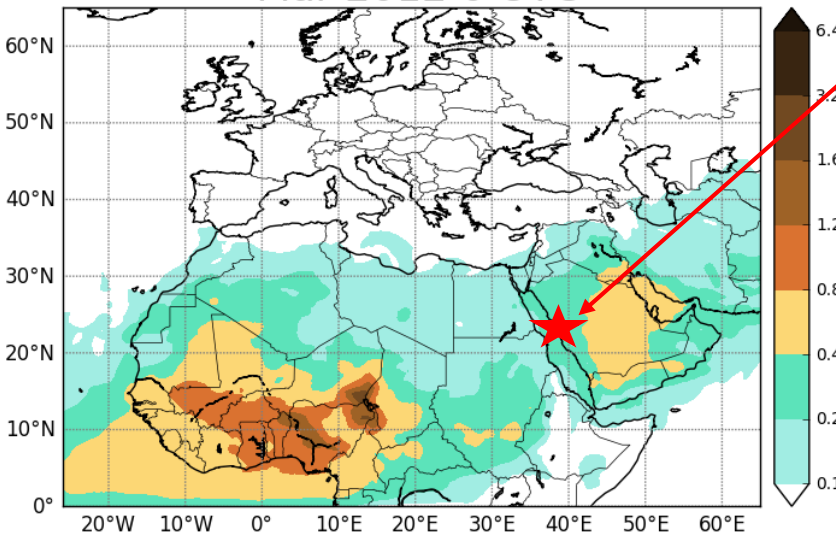


# Indipendent validation

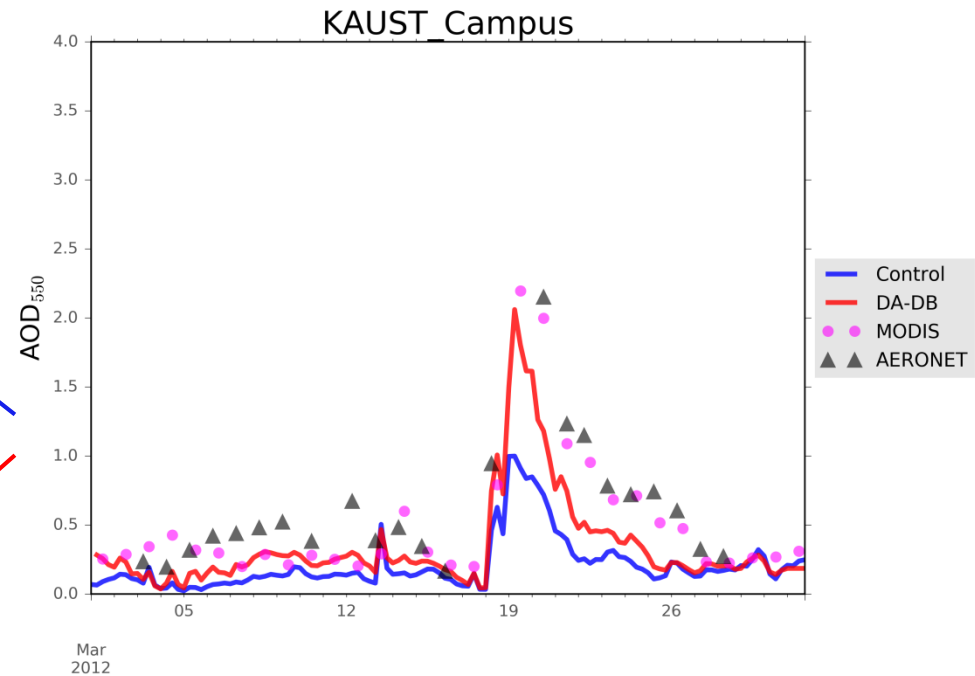
Dust AOD (550nm), control  
Mar 2012 0 UTC



Dust AOD (550nm), analysis  
Mar 2012 0 UTC

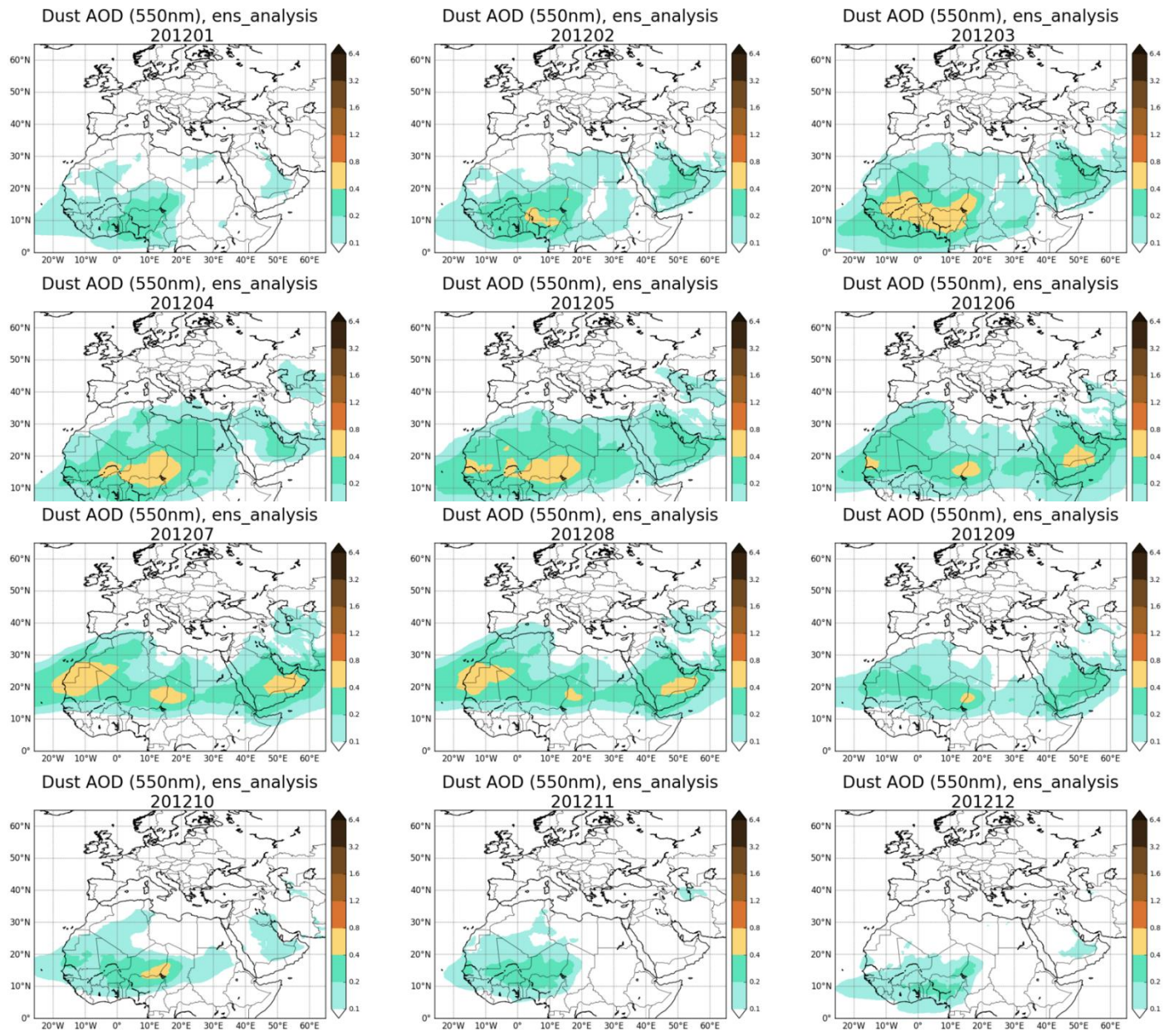


*0.33°x0.33° model resolution*





# Higher resolution analysis



## Next step

**DustClim**



*European Research Area  
for Climate Services*

Produce an high resolution dust reanalysis for Northern Africa, Middle East and Europe covering the satellite era of quantitative aerosol information, and develop dust-related services tailored to specific socio-economic sectors.





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**EXCELENCIA  
SEVERO  
OCHOA**

Thank you

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